

Improving Core Resilience of Network under Random Edge Deletion

Ricky Laishram
Syracuse University
rlaishra@syr.edu

Ahmet Erdem Sariyüce
University at Buffalo
erdem@buffalo.edu

Tina Eliassi-Rad
Northeastern University
eliassi@neu.edu

Ali Pinar
Sandia National Laboratories
apinar@sandia.gov

Sucheta Soundarajan
Syracuse University
susounda@syr.edu

Introduction

- The k -core of a network is the maximal sub-graph in which every node has at least k neighbors [1].
- Nodes that belong to higher k -cores are considered to be more central within the network.
- The idea of k -cores have been used in to various applications – studying the internet [2], predicting protein functions [3] etc.

Problem

- How can we characterize the resilience of the k -core structure of a network against random edge deletion?
- Given a network, how can we improve the the resilience of its k -core against edge deletion?

Proposed Measures

Network Level Property:

- **n,p -Core Resilience:** It is defined as the rank correlation between the ranking of the top $n\%$ nodes (ranked by core number) in the original network to that of the network after $p\%$ edges have been removed uniformly at random.

Node Level Property:

- **Core Strength:** It is a measure of how robust the node's core number is against edge deletion.

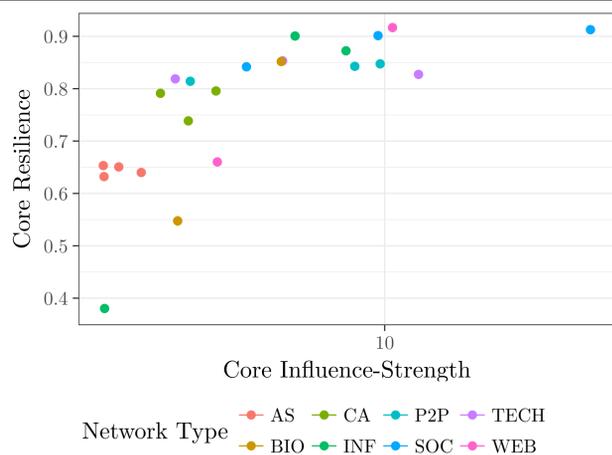
$$CS(u, G) = |\{v : v \in \Gamma(u, G), K(u, G) \leq K(v, G)\}| - K(u, G)$$

- **Core Influence:** It is a measure of how much other nodes relies on it for their core numbers

$$CI(u, G) = \sum_{v \in V_{\delta} \cap \Delta_{>}(u, G)} \frac{CI(v, G)}{|\Delta_{>}(v, G)|}$$

Networks in which the nodes with high Core Influence also have high Core Strength are also likely to have high Core Resilience.

Core Resilience vs Core Influence-Strength



Improving Core Resilience

Problem: Given a graph G and edge budget b , which b edges should we add so that the core resilience of the modified network is as high as possible, without changing the core numbers?

Idea: Add the edges in such a way that it improves the Core Strength of the nodes with high Core Influence.

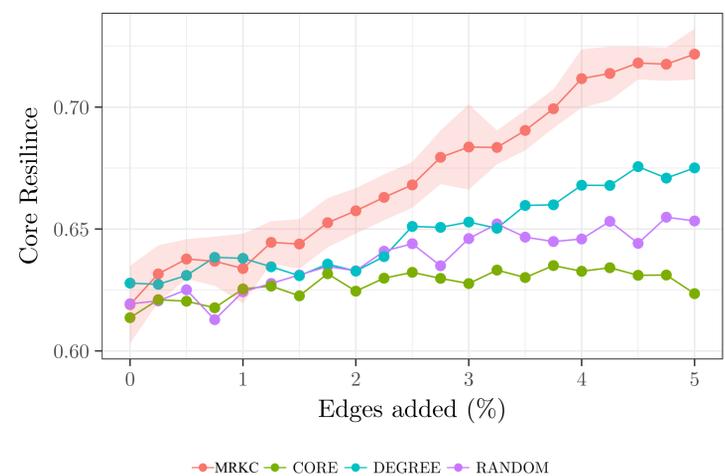
Maximize Resilience of k -Core (MRKC)

- Let E' be the set of edges that do not exist in G .
- Filter out edges from E' that would change the core number if they are added to G [4].
- For all $(u, v) \in E'$, assign edge priority as,

$$\rho(u, v) = \begin{cases} \frac{CI(u, G)}{CS(u, G)} & \text{if } K(u, G) < K(v, G) \\ \frac{CI(v, G)}{CS(v, G)} & \text{if } K(u, G) > K(v, G) \\ \frac{CI(u, G)}{CS(u, G)} + \frac{CI(v, G)}{CS(v, G)} & \text{if } K(u, G) = K(v, G) \end{cases}$$

- Add the edges in decreasing order of the priority.

Result



Notations

$\Gamma(u, G)$	Neighbors of node u in G
$K(u, G)$	Core number of node u in G
$\Delta_{>}(u, G)$	Neighbors of u with core numbers greater than that of u in G

References

1. Stephen B Seidman. 1983. Network structure and minimum degree. *Social networks* 5, 3 (1983), 269–287.
2. Shai Carmi, Shlomo Havlin, Scott Kirkpatrick, Yuval Shavitt, and Eran Shir. 2007. A model of Internet topology using k -shell decomposition. *Proceedings of the National Academy of Sciences* 104, 27 (2007), 11150–11154.
3. Md Altaf-Ul-Amine, Kensaku Nishikata, Toshihiro Korna, Teppei Miyasato, Yoko Shinbo, Md Arifuzzaman, Chieko Wada, Maki Maeda, Taku Oshima, Hirotsada Mori, et al. 2003. Prediction of protein functions based on k -cores of protein-protein interaction networks and amino acid sequences. *Genome Informatics* 14 (2003), 498–499.
4. Ahmet Erdem Sariyüce, Buğra Gedik, Gabriela Jacques-Silva, Kun-Lung Wu, and Ü. V. Çatalyürek. 2013. Streaming Algorithms for K -core Decomposition. *Proc. VLDB Endow.* 6, 6 (April 2013), 433–444.

Full Paper

Ricky Laishram, Ahmet Erdem Sariyüce, Tina Eliassi-Rad, Ali Pinar, and Sucheta Soundarajan. Measuring and Improving the Core Resilience of Networks. In *WWW 2018: The 2018 Web Conference, April 23–27, 2018, Lyon, France*.